

r -indexing Wheeler graphs

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*Palindrome! :o)

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A Wheeler graph is a directed edge-labelled graph whose vertices can be ordered such that those with in-degree 0 precede those with positive in-degree and, for any pair of edges $e = (u, v)$ and $e' = (u', v')$ labelled a and a' respectively,

- if $a \prec a'$ then $v < v'$,
- if $a = a'$ and $u < u'$ then $v \leq v'$.

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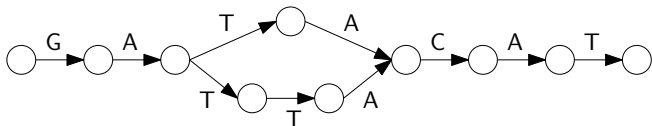
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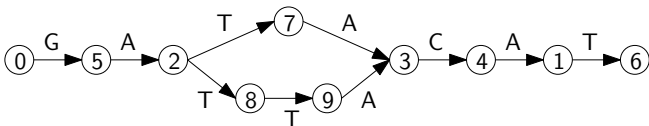
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Theorem

If G is a Wheeler graph and we store a rank data structure over its edge-labels, ordered by their origins, and partial sum data structures over its vertices' in- and out-degrees then later, given a pattern P , in $O(|P| \log \log |G|)$ time we can find the interval in the Wheeler order containing vertices reachable by paths labelled P .

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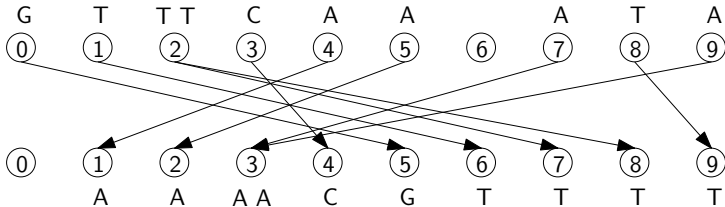
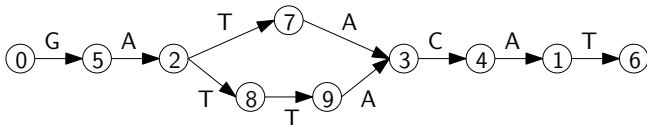
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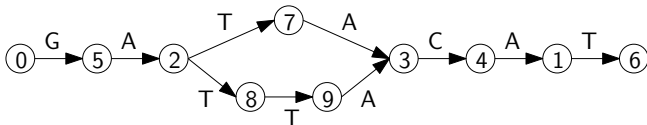
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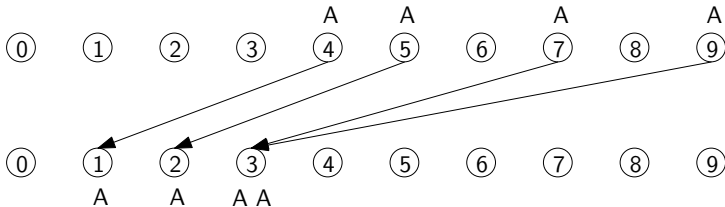
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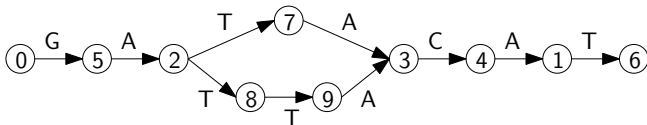
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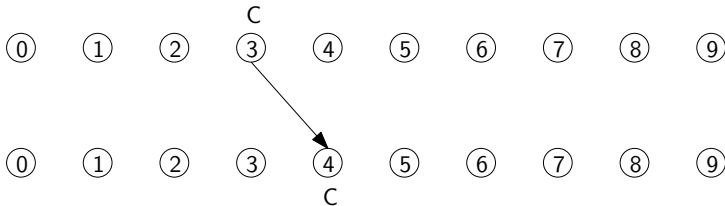
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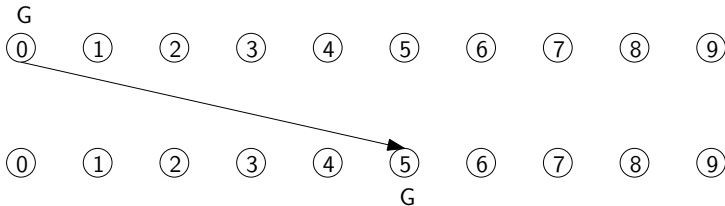
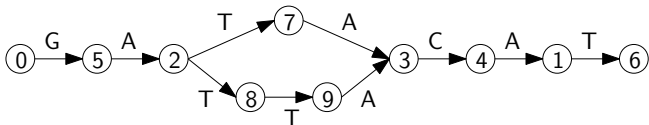
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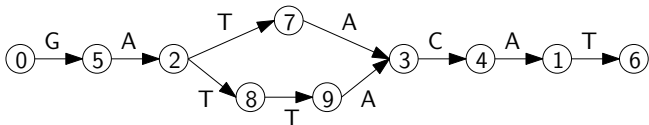
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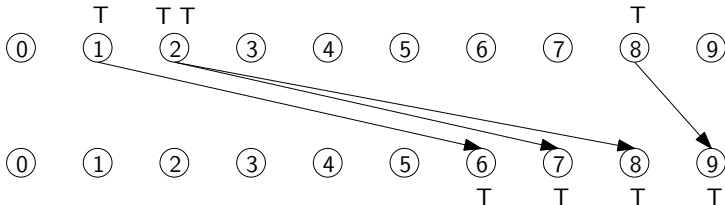
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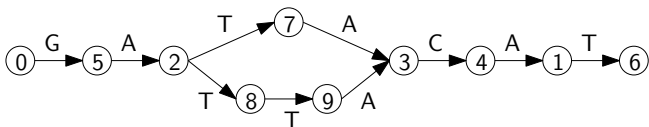
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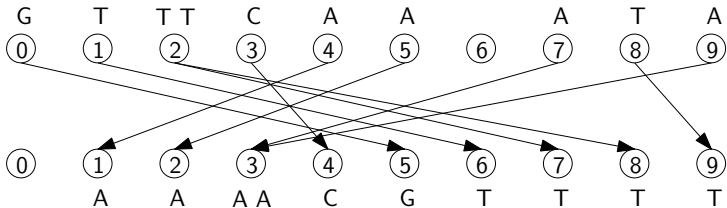
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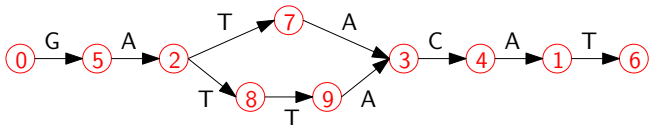
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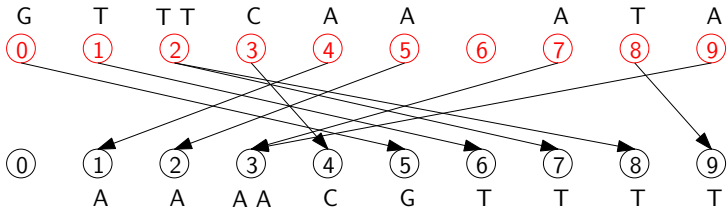
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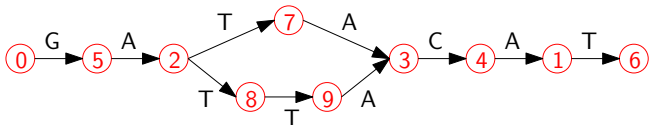
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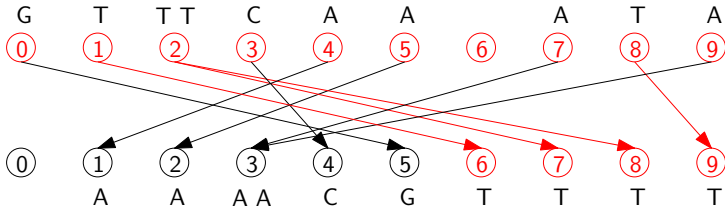


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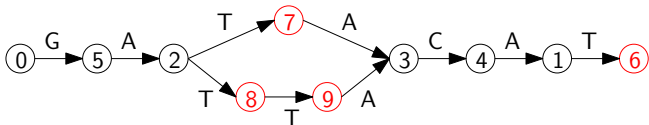
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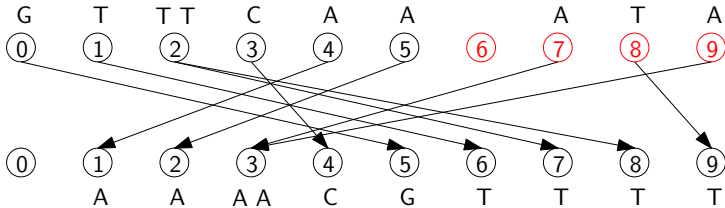


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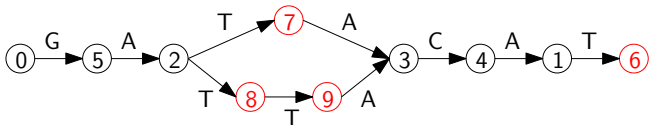
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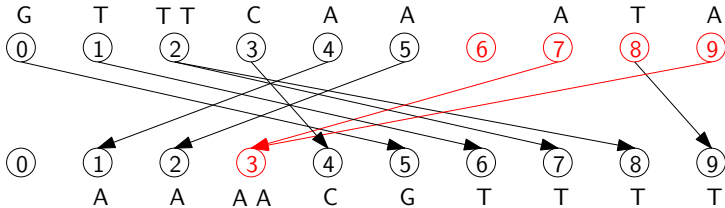


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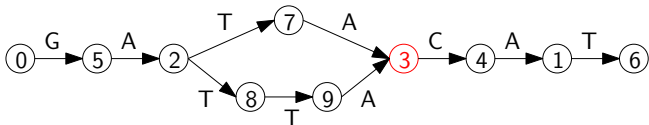
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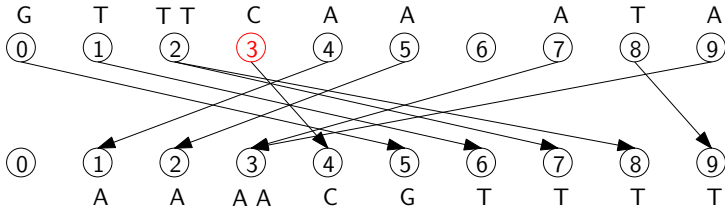
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Theorem

Let S be a string and r be the number of runs in a BWT of S . We can store S in $O(r)$ space such that later, given a pattern P , in $O(|P| \log \log |S|)$ time we can find the interval in the BWT containing characters preceding occurrences of P in S , and then report the locations of those occurrences in $O(\log \log |S|)$ time per occurrence.

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Nishimoto & Tabei: total time is $O(|P| + \text{occ})$ when the alphabet size is $\text{polylog}(|S|)$.

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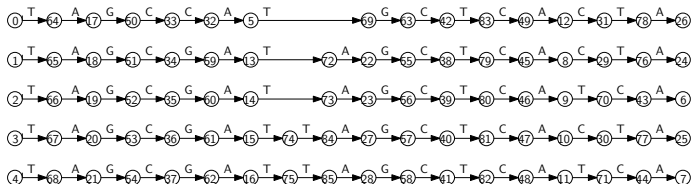
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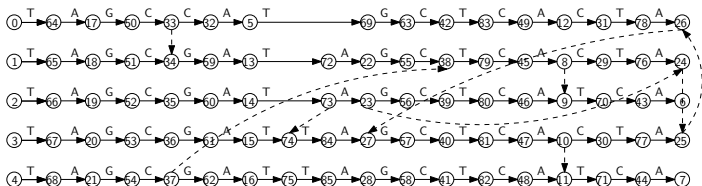
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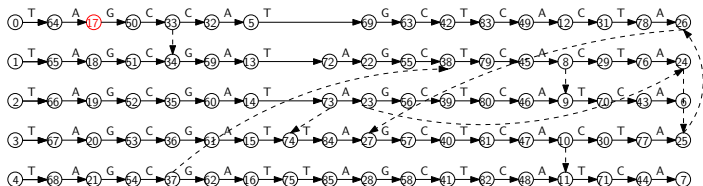
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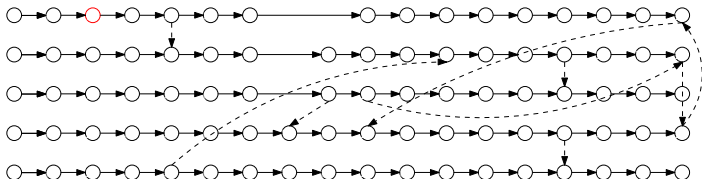
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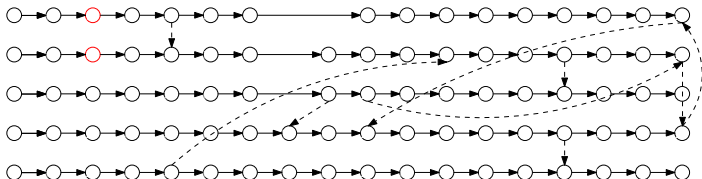
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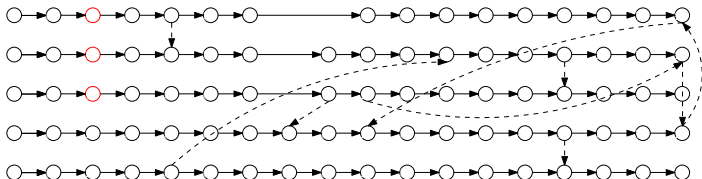
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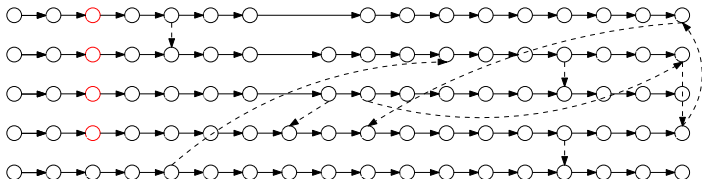
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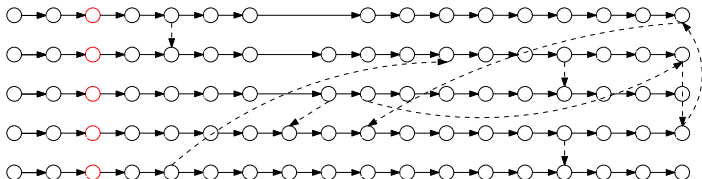
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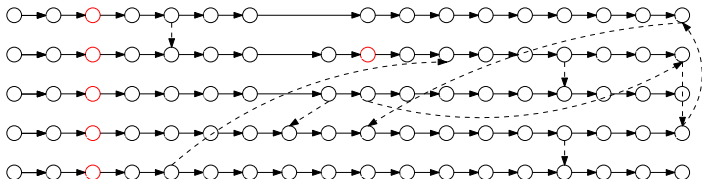
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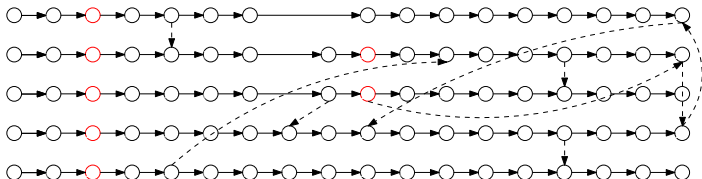
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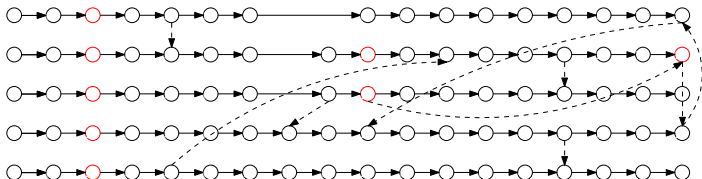
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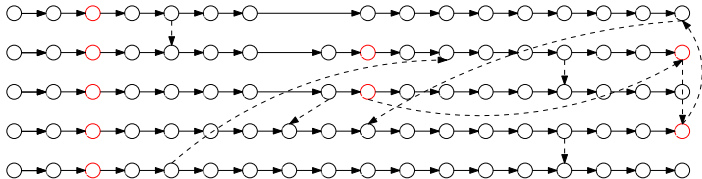
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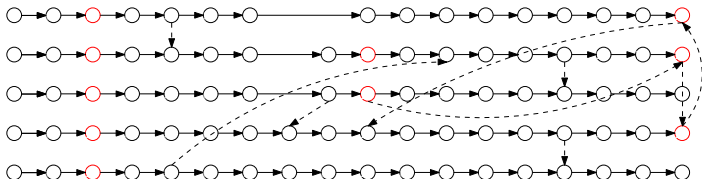
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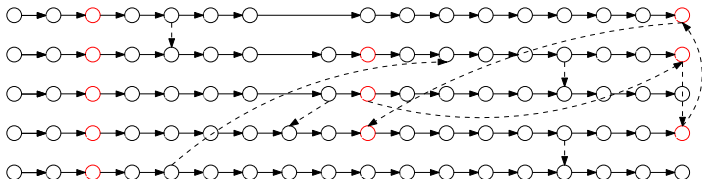
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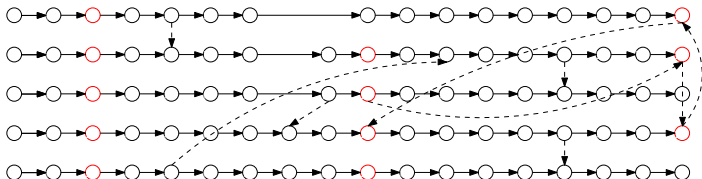
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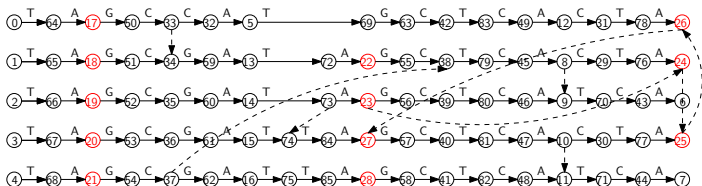
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Theorem

Let G be a Wheeler graph and r be the number of runs in a BWT of G , and suppose G can be decomposed into v edge-disjoint directed paths whose internal vertices each have in- and out-degree exactly 1. We can store G in $O(r + v)$ space such that later, given a pattern P , in $O(|P| \log \log |G|)$ time we can count the vertices of G reachable by directed paths labelled P , and then report those vertices in $O(\log \log |G|)$ time per vertex.

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Theorem

Let G be a Wheeler graph and r be the number of runs in a BWT of G , and suppose G can be decomposed into v edge-disjoint directed paths whose internal vertices each have in- and out-degree exactly 1. We can store G in $O(r + v)$ space such that later, given a pattern P , in $O(|P| \log \log |G|)$ time we can count the vertices of G reachable by directed paths labelled P , and then report those vertices in $O(\log \log |G|)$ time per vertex.

Can we use Nishimoto & Tabei's technique to get $O(|P| + \text{occ})$ time when the alphabet size is polylog($|G|$)?

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- 1 v (“upsilon”) is the number of unitigs
- 2 Travis says \ups (“oops”) a lot

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We needed a special case of this theorem in a recent paper Garance will present, about long and stringy trees.

It's easier to prove the general theorem than to explain why we'd want it. Wheeler graphs are cool and *r*-indexes are cool, so *r*-indexing Wheeler graphs is really cool?

Jouni says he's already implemented something like this, so it must be useful for something. . .

Nicola has a more sophisticated result in a SODA '21 paper (but I'm not sure it's practical).

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definition

Uwe Baier introduced tunnelling to reduce the number of times we write large run-lengths in the RLBWT.

We can put paths in a Wheeler graph together in a tunnel if

- corresponding edge labels match
- corresponding vertices' ranks are incremented in the Wheeler order.

We stop merging “one edge too early”.

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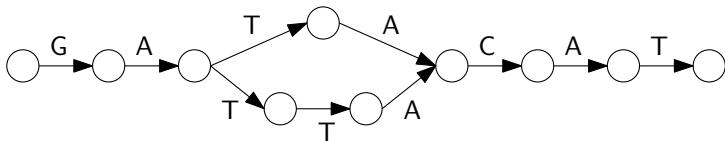
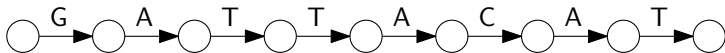
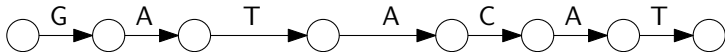
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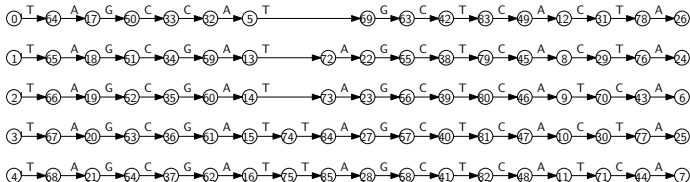
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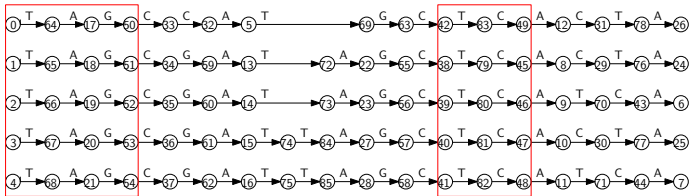
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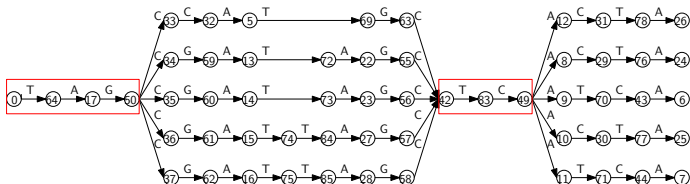
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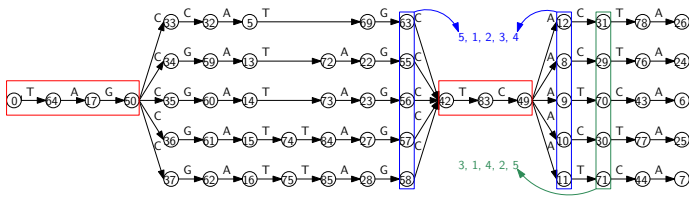
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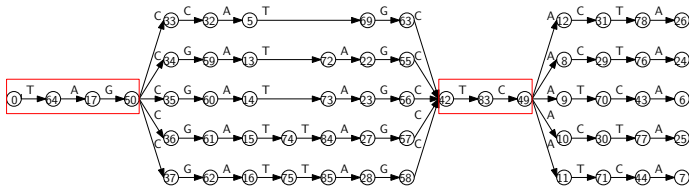
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chimeric matches



Theorem

We can index a tunnelled Wheeler graph so as to prevent false-positive, chimeric matches.

(In our example, if the first variation is CAT, the second variation *isn't* TC.)

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② tunnels are FIFO

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Would we want to *r*-index a tunnelled Wheeler graph?

Doesn't tunnelling the graph collapse the runs in the BWT?

Wouldn't a standard sampling be better then?

Suppose

- the conserved regions between variation sites are on the order of 1K bp
- the probability of a bp mutating is on order of 1 in $100M^\dagger$
- we're indexing 1M genomes.

We'd like to tunnel the conserved regions, but how do we deal with the mutations?

[†]I've read this is the mutation rate in humans, but that seems to be the probability a bp is mutated between generations, not the probability of picking a bp and a person at random and having that bp mutated in that person. Any idea?

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(not recommended!)

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The “conserved” regions of about 1K bp are each broken up by about $(1M \times 1K/100M) = 10$ mutations, in expectation.

If we merge the paths in each conserved region into about 10 tunnels, however, then we *should* get a significantly smaller, interesting Wheeler graph whose BWT is still highly run-length compressible?

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Happy Year of the Ox!

Un saludo pa' Moni!